

# Reasoning over Assumption-Based Argumentation Frameworks via Direct Answer Set Programming Encodings

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## Abstract

Focusing on assumption-based argumentation (ABA) as a central structured formalism to AI argumentation, we propose a new approach to reasoning in ABA with and without preferences. While previous approaches apply either specialized algorithms or translate ABA reasoning to reasoning over abstract argumentation frameworks, we develop a direct approach to ABA reasoning by encoding ABA reasoning tasks in answer set programming. Our approach significantly improves on the empirical performance of current ABA reasoning systems. Furthermore, while the complexity of reasoning over ABA frameworks is well-understood, the complexity of reasoning in the  $ABA^+$  formalism integrating preferences into ABA is currently less understood. Towards bridging this gap, we also give new complexity results for reasoning in  $ABA^+$ , suggesting that the integration of preferential information into ABA results in increased problem complexity for several central argumentation semantics.

## 1 Introduction

The study of computational models for argumentation is a vibrant area of AI and knowledge representation (KR) research. As KR formalisms, computational models of argumentation capture various related paradigms, including non-monotonic reasoning and logic programming (Dung 1995), and furthermore open up avenues for various types of applications (Atkinson et al. 2017).

Arguments most often have an intrinsic structure made explicit through derivations from more basic structures. Computational models for *structured argumentation* (Besnard et al. 2014; Bondarenko et al. 1997; García and Simari 2004; Besnard and Hunter 2008; Prakken 2010; Bondarenko et al. 1997; Dung, Kowalski, and Toni 2009; Toni 2014) provide formalisms and methods for making the internal structure of arguments explicit. This is in contrast to abstract argumentation, where the structure of individual arguments is completely abstract, and reasoning over abstract argumentation frameworks (AFs) (Dung 1995) is restricted to the level of pair-wise knowledge of attacks between conflicting arguments. While noticeable attention has been recently paid on computational approaches for AFs (Charwat et al. 2015), advancing understanding of the complexity of

and algorithms for reasoning over structured argumentation frameworks has received less attention and can be perceived as more challenging.

In this paper we focus on assumption-based argumentation (ABA) (Bondarenko et al. 1997; Dung, Kowalski, and Toni 2009; Toni 2014; Cyras et al. 2018) as one of the central structured argumentation formalisms which provides a suitable model for various application scenarios (Craven et al. 2012; Fan et al. 2014; Matt et al. 2008). We propose a new computational approach to reason in ABA with and without preferences. While previous approaches are based on either specialized algorithms or translating ABA reasoning to reasoning over AFs, we propose a direct approach to ABA reasoning based on encoding ABA reasoning tasks in answer set programming (ASP) (Brewka, Eiter, and Truszczyński 2011). While related encodings have been considered previously focusing on representational aspects in the context of ABA (Egly and Woltran 2006; Caminada and Schulz 2017), motivated by the success of ASP encodings for AFs (Toni and Sergot 2011) we present novel types of ASP encodings for ABA, and for  $ABA^+$  (Cyras and Toni 2016a; 2016c; Bao, Cyras, and Toni 2017) that integrates preferences into ABA, and in particular provide a first empirical evaluation of this approach. Our approach significantly improves on the empirical performance of currently available ABA reasoning systems, in particular the dispute derivation approach (Gaertner and Toni 2007a; 2007b; 2008; Dung, Mancarella, and Toni 2007; Craven et al. 2012; Toni 2013; Craven, Toni, and Williams 2013) implemented in the abaglyph system (Craven and Toni 2016) and the translation-based approach (Dung, Mancarella, and Toni 2007; Caminada et al. 2013) implemented in the aba2af system (Lehtonen, Wallner, and Järvisalo 2017) for ABA, as well as the ABAPLUS system (Bao, Cyras, and Toni 2017) for  $ABA^+$  to the extent applicable. Furthermore, while the complexity of reasoning over ABA frameworks is well-understood (Dimopoulos, Nebel, and Toni 2002), the complexity of reasoning in the  $ABA^+$  formalism is currently less understood. Towards bridging this gap, we also give new complexity results for reasoning in  $ABA^+$ , suggesting that the integration of preferential information into ABA results in increased problem complexity for several central argumentation semantics.

Detailed technical proofs not included in the paper proper are provided in the paper supplement.

## 2 Assumption-Based Argumentation

We recall assumption-based argumentation (ABA) (Bondarenko et al. 1997; Toni 2014; Cyras et al. 2018) and  $ABA^+$  (Cyras and Toni 2016a; 2016c; Bao, Cyras, and Toni 2017) that equips ABA with preferences over assumptions. Since  $ABA^+$  is a strict generalization of ABA, we directly define the former and point out differences to the latter.

We assume a deductive system  $(\mathcal{L}, \mathcal{R})$  with  $\mathcal{L}$  a formal language, i.e., a set of sentences, and  $\mathcal{R}$  a set of inference rules over  $\mathcal{L}$  with a rule  $r \in \mathcal{R}$  having the form  $a_0 \leftarrow a_1, \dots, a_n$  with  $a_i \in \mathcal{L}$ . We denote the head of rule  $r$  by  $head(r) = \{a_0\}$  and the (possibly empty) body of  $r$  with  $body(r) = \{a_1, \dots, a_n\}$ .

A central concept of  $ABA^+$  is how a sentence can be derived from a given set of assumptions and a set of rules. In ABA, several notions of derivability are studied (Dung, Kowalski, and Toni 2006; Dung, Toni, and Mancarella 2010), with tree-derivability ( $\models$ ) being the commonly considered one. ABA (without preferences) can be equivalently defined via forward-derivability (Dung, Kowalski, and Toni 2006; Dung, Toni, and Mancarella 2010), and we will make use of this fact here for developing ASP encodings for ABA under various semantics. In contrast, tree-derivability is central for defining  $ABA^+$ , and the equivalence with forward-derivability does not carry over in general to  $ABA^+$ . However, as we will show, tree-derivability and forward-derivability remain equivalent also for  $ABA^+$  under specific semantics, which allows for an ASP encoding similar to those we develop for ABA.

A sentence  $s \in \mathcal{L}$  is tree-derivable from a set of assumptions  $X \subseteq \mathcal{A}$  and rules  $R \subseteq \mathcal{R}$ , denoted by  $X \models_R s$ , if there is a finite tree with the root labeled by  $s$ , the leaves labeled by elements of  $X$ , and for each internal node labeled with  $t$  there is a rule  $r \in R$  s.t. the set of labels of the children of this node is equal to  $body(r)$  and the node itself is labeled by  $head(r)$ . For each rule  $r \in R$  there is a node labeled in this way. In brief, there is a derivation tree from assumptions  $X$  and rules  $R$  to sentence  $s$ . Unless not clear from the context, we will usually write  $\models_R$  without explicitly defining  $R$  and assume that  $R \subseteq \mathcal{R}$  from the given deductive system.

A sentence  $a \in \mathcal{L}$  is forward-derivable from a set  $X \subseteq \mathcal{A}$  via rules  $\mathcal{R}$ , denoted by  $X \vdash_{\mathcal{R}} a$ , if there is a sequence of rules  $(r_1, \dots, r_n)$  s.t.  $head(r_n) = a$  and for each rule  $r_i$  we have  $r_i \in \mathcal{R}$  and each sentence in the body of  $r_i$  is derived from rules earlier in the sequence or in  $X$ , i.e.,  $body(r_i) \subseteq X \cup \bigcup_{j < i} head(r_j)$ .

By (Dung, Kowalski, and Toni 2006; Dung, Toni, and Mancarella 2010), if  $X \models_R s$  then  $X \vdash_{\mathcal{R}} s$ , and if  $X \vdash_{\mathcal{R}} s$  there is an  $X' \subseteq X$  and  $R \subseteq \mathcal{R}$  s.t.  $X' \models_R s$ . That is,  $\models$  is “stricter” (requires a tree derivation where all assumptions and rules are required for derivation), while  $\vdash$  is simpler (no witness tree is required and redundant assumptions and rules are allowed). The deductive closure for an assumption set  $X$  w.r.t. rules  $\mathcal{R}$  is given by  $Th_{\mathcal{R}}(X) = \{a \mid X \vdash_{\mathcal{R}} a\}$  (there is an equivalent definition via  $\models$ ). If the type of derivation is not relevant, we generally refer to derivations.

An  $ABA^+$  framework is a tuple  $F = (\mathcal{L}, \mathcal{R}, \mathcal{A}, \preceq)$  with  $(\mathcal{L}, \mathcal{R})$  a deductive system, a set of assumptions  $\mathcal{A} \subseteq \mathcal{L}$ , a

function  $\preceq$  mapping assumptions  $\mathcal{A}$  to sentences  $\mathcal{L}$ , and a preorder  $\leq$  on  $\mathcal{A}$ . The strict counterpart  $<$  of  $\leq$  is defined as usual by  $a < b$  iff  $a \leq b$  and  $b \not\leq a$ , for  $a, b \in \mathcal{A}$ . In this paper, we focus on so-called flat  $ABA^+$  frameworks where assumptions cannot be derived, i.e., do not occur in heads of rules. Further, we assume that any set of an  $ABA^+$  is finite.

**Definition 1.** Let  $(\mathcal{L}, \mathcal{R}, \mathcal{A}, \preceq)$  be an  $ABA^+$  framework, and  $A, B \subseteq \mathcal{A}$  be two sets of assumptions. Assumption set  $A$  *<-attacks*  $B$  if

- $A' \models_R \bar{b}$ , for some  $A' \subseteq A$ ,  $b \in B$ , and  $\nexists a' \in A'$  with  $a' < b$ , or
- $B' \models_R \bar{a}$  for some  $a \in A$  and  $B' \subseteq B$  s.t.  $\exists b' \in B'$  with  $b' < a$ .

In words, set  $A$  attacks  $B$  if (i) from  $A$ , via subset  $A'$ , one can tree-derive a contrary of an assumption  $b \in B$  and no member in  $A'$  is strictly less preferred than  $b$ , or (ii) from  $B$ , via subset  $B'$  one can tree-derive a contrary of an assumption  $a \in A$  and some member of  $B'$  is strictly less preferred than  $a$ . Attacks of type (i) are *normal* <-attacks and those of type (ii) *reverse* <-attacks, with the intuition that the (non-preference based) conflict in (i) succeeds and in case of (ii) is countered and reversed by the preference relation.

**Definition 2.** Let  $F = (\mathcal{L}, \mathcal{R}, \mathcal{A}, \preceq)$  be an  $ABA^+$  framework. An assumption set  $A \subseteq \mathcal{A}$  is called *conflict-free* if  $A$  does not <-attack itself. Set  $A$  *defends* assumption set  $B \subseteq \mathcal{A}$  if for all  $C \subseteq \mathcal{A}$  that <-attack  $B$  it holds that  $A$  <-attacks  $C$ .

**Definition 3.** Let  $F = (\mathcal{L}, \mathcal{R}, \mathcal{A}, \preceq)$  be an  $ABA^+$  framework. Further, let  $A \subseteq \mathcal{A}$  be a conflict-free set of assumptions in  $F$ . Set  $A$  is

- <-admissible in  $F$  if  $A$  defends itself;
- <-complete in  $F$  if  $A$  is admissible in  $F$  and contains every assumption set defended by  $A$ ;
- <-grounded in  $F$  if  $A$  is the intersection of all <-complete assumption sets;
- <-preferred in  $F$  if  $A$  is <-admissible and there is no <-admissible set of assumptions  $B$  in  $F$  with  $A \subset B$ ; and
- <-stable in  $F$  if each  $\{x\} \subseteq \mathcal{A} \setminus A$  is <-attacked by  $A$ .<sup>1</sup>

We use the term <- $\sigma$ -assumption-set for an assumption set under a semantics  $\sigma \in \{adm, com, grd, stb, prf\}$ , i.e., <-admissible, <-complete, <-grounded, <-stable, and <-preferred semantics, respectively.

An ABA framework, that is  $ABA^+$  without preferences, is a tuple  $F = (\mathcal{L}, \mathcal{R}, \mathcal{A}, \emptyset)$  (i.e.  $\preceq = \emptyset$ ). We will denote ABA frameworks by  $F = (\mathcal{L}, \mathcal{R}, \mathcal{A}, \preceq)$ , i.e., omitting the empty preference relation, and refer to the corresponding semantics, likewise, without the preference relation  $<$  (e.g., complete semantics instead of <-complete semantics). Attacks ( $\emptyset$ -attacks) in ABA frameworks simplify to attacks from assumption sets  $A$  to assumption sets  $B$  when  $A \vdash_{\mathcal{R}} \bar{b}$  for  $b \in B$  (these are normal <-attacks when no preference information is available; reverse <-attacks are not present in ABA). Note that forward-derivability

<sup>1</sup>In non-flat  $ABA^+$  grounded semantics is referred to as well-founded semantics. We consider here only flat frameworks.

is sufficient for ABA (Dung, Kowalski, and Toni 2006; Dung, Toni, and Mancarella 2010).

Main reasoning tasks on  $ABA^+$  are the following.

**Definition 4.** Let  $F = (\mathcal{L}, \mathcal{R}, \mathcal{A}, \neg, \leq)$  be an  $ABA^+$  framework and  $<-\sigma$  a semantics. A sentence  $s \in \mathcal{L}$  is

- *credulously accepted* in  $F$  under semantics  $<-\sigma$  if there is a  $<-\sigma$ -assumption-set  $A$  s.t.  $s \in Th_{\mathcal{R}}(A)$ ; and
- *skeptically accepted* in  $F$  under semantics  $<-\sigma$  if  $s \in Th_{\mathcal{R}}(A)$  for all  $<-\sigma$ -assumption-sets  $A$ .

The tasks for ABA are analogous, the preference relation  $<$  is simply disregarded. For ABA, credulous reasoning under admissible, complete, and preferred semantics coincide (Bondarenko et al. 1997; Cyras et al. 2018).

**Example 1.** Let  $F = (\mathcal{L}, \mathcal{R}, \mathcal{A}, \neg)$  be an ABA with assumptions  $\mathcal{A} = \{a, b, c, d\}$ , sentences  $\mathcal{L} = \{x, b^c, c^c, d^c\} \cup \mathcal{A}$ , rules  $(x \leftarrow a)$ ,  $(c^c \leftarrow b, x)$ ,  $(b^c \leftarrow c)$ , and  $(d^c \leftarrow a, b)$ , where  $b^c$ ,  $c^c$ , and  $d^c$  are the contraries of  $b$ ,  $c$ , and  $d$ , respectively. The complete assumption sets are  $\{a\}$ ,  $\{a, b\}$ , and  $\{a, c, d\}$ , with  $\{a\}$  the grounded assumption set (this assumption is not attacked). The sets  $\{a, b\}$  and  $\{a, c, d\}$  are also stable: e.g., the first set attacks via the second and fourth rules the assumptions  $\{c\}$  and  $\{d\}$ . Sentence  $x$  is credulously accepted under admissible, complete, stable, and preferred. Under preference  $a < d$ , in the resulting  $ABA^+ F' = (\mathcal{L}, \mathcal{R}, \mathcal{A}, \neg, \leq)$  the set  $\{a, b\}$  is not  $<$ -stable (the attack from  $\{a, b\}$  to  $d$  is reversed), while set  $\{a, c, d\}$  is  $<$ -stable. By the further preference  $c < b$ , the set  $\{c\}$  does not  $<$ -attack  $\{b\}$ , resulting in no  $<$ -stable assumption sets.

Computational complexity of reasoning over ABA is well-established (Dimopoulos, Nebel, and Toni 2002): credulous reasoning for admissible, stable, and preferred semantics is NP-complete, while skeptical reasoning is P-complete under admissible, coNP-complete under stable, and  $\Pi_2^P$ -complete under preferred semantics.<sup>2</sup> Complexity of ABA with preferences has, to our knowledge, not being studied in-depth; Wakaki (2017) showed complexity results for p-ABA, an alternative way of handling preferences in ABA. However, the results are not directly transferable to  $ABA^+$ .

Finally, the so-called Axiom of Weak Contraposition (WCP) bridges  $ABA^+$  with the semantics of ABA. Namely, if an  $ABA^+$  framework satisfies WCP, then further properties on the semantics hold (Cyras and Toni 2016b), e.g., the grounded assumption set is guaranteed to exist.

**Definition 5.** An  $ABA^+ (\mathcal{L}, \mathcal{R}, \mathcal{A}, \neg, \leq)$  satisfies the Axiom of Weak Contraposition (WCP) if for each  $A \subseteq \mathcal{A}$ ,  $R \subseteq \mathcal{R}$ , and  $b \in \mathcal{A}$ , if  $A \models_R \bar{b}$  and  $\exists a' \in A$  s.t.  $a' < b$ , then there is a  $\leq$ -minimal  $a \in A$  s.t.  $a < b$  and  $A' \models_{R'} \bar{a}$  for some  $A' \subseteq (A \setminus \{a'\}) \cup \{b\}$  and  $R' \subseteq \mathcal{R}$ .

### 3 Properties and Complexity Results

We discuss properties essential for developing our ASP encodings, as well as establish complexity results for  $ABA^+$ . More technical proofs are available in the supplement.

<sup>2</sup>The complexity class  $\Pi_2^P$  is the complementary class of the class  $\Sigma_2^P$  consisting of problems decidable with a polynomial non-deterministic algorithm that can access an NP-oracle.

**ABA.** We begin with slightly re-stating some of the ABA semantics in terms that are suited for subsequent encodings. Let  $(\mathcal{L}, \mathcal{R}, \mathcal{A}, \neg)$  be an ABA framework and  $E \subseteq \mathcal{A}$  be a set of assumptions. Define  $D_E = \{a \in \mathcal{A} \mid E \text{ attacks } \{a\}\}$ . Recall that in ABA  $E$  attacks  $\{a\}$  iff  $E \vdash_{\mathcal{R}} \bar{a}$ .

**Proposition 1.** Let  $(\mathcal{L}, \mathcal{R}, \mathcal{A}, \neg)$  be an ABA framework and  $E \subseteq \mathcal{A}$  be a conflict-free set of assumptions. It holds that

- set  $E$  defends an assumption set  $\{a\} \subseteq \mathcal{A}$  iff  $\mathcal{A} \setminus D_E$  does not attack  $\{a\}$ ;
- set  $E$  is admissible iff  $\mathcal{A} \setminus D_E$  does not attack  $E$ ; and
- set  $E$  is complete iff  $E$  is admissible and for each  $b \in \mathcal{A} \setminus E$  we have  $\{b\}$  is attacked by  $\mathcal{A} \setminus D_E$ .

For Proposition 1, which follows straightforwardly from the definitions, we emphasize that the main ingredient to check whether a set is admissible or complete is the set  $D_E$ , which can be computed in polynomial time (since  $\vdash_{\mathcal{R}}$  is decidable in polynomial time). Further, for ABA frameworks, the grounded semantics can be characterized by the function  $def(A) = \{a \in \mathcal{A} \mid A \text{ defends } a\}$ , as shown in (Bondarenko et al. 1997, Theorem 6.2). The grounded assumption set of an ABA framework is the least fixed point of  $def$ . The complexity of grounded and complete semantics of ABA has, to our knowledge, not been made explicit, but since  $D_E$ , and thus  $def$ , can be computed in polynomial time, one can straightforwardly infer their complexity.

**Corollary 2.** For a given ABA framework, one can in polynomial time (i) compute the grounded assumption set, and (ii) verify whether a given set of assumptions is complete.

**ABA<sup>+</sup>.** Tree-derivability is used for defining  $<$ -attacks in  $ABA^+$ . Unlike in ABA, tree-derivations and forward-derivations are not equivalent when using them to define  $<$ -attacks. This can be seen when  $A$  normally  $<$ -attacks  $B$ : adding redundant assumptions to  $A$  (not used for deriving a sentence) may weaken the set and make it open for reverse  $<$ -attacks that are not present in the original definition via  $\models$  (e.g. by  $A' = A \cup \{a'\}$  with  $a' < b$  for a  $b \in B$  and  $A' \vdash_{\mathcal{R}} \bar{b}$  but  $A' \not\models_{\mathcal{R}} \bar{b}$ ). However, normal  $<$ -attacks can be defined via  $\vdash$ , which follows from (Dung, Kowalski, and Toni 2006; Dung, Toni, and Mancarella 2010), and reverse  $<$ -attacks in the special case of conflict-free sets  $A$  that reversely  $<$ -attack a singleton set  $\{b\}$ .

**Lemma 3.** Let  $(\mathcal{L}, \mathcal{R}, \mathcal{A}, \neg, \leq)$  be an  $ABA^+$  framework, and  $A, B \subseteq \mathcal{A}$  be two sets of assumptions, and  $b \in \mathcal{A}$ .

- Set  $A$  normally  $<$ -attacks  $B$  iff  $A' \vdash_{\mathcal{R}} \bar{b}$ , for some  $A' \subseteq A$ ,  $b \in B$ , and  $\nexists a' \in A'$  with  $a' < b$ .
- If  $A$  is conflict-free, we have  $A$  reversely  $<$ -attacks  $\{b\}$  iff  $\{b\} \vdash_{\mathcal{R}} \bar{a}$  for some  $a \in A$  and  $b < a$ .

To see why a conflict-free set  $A$  reversely  $<$ -attacks  $\{b\}$  as stated in the second condition of the lemma, first note that, since  $A$  is conflict-free, we have  $\emptyset \not\models_{\mathcal{R}} \bar{a}$  for all  $a \in A$ . Thus, also  $\emptyset \not\vdash_{\mathcal{R}} \bar{a}$ . This means that  $\{b\} \vdash_{\mathcal{R}} \bar{a}$  iff  $\{b\} \models_{\mathcal{R}} \bar{a}$ , for some  $a \in A$ , since there is no subset of  $\{b\}$  that forward-derives  $\bar{a}$ , by presumption of  $A$  being conflict-free.

A use for the preceding lemma is that one can check whether a set of assumptions is  $<$ -stable via relying only

on forward-derivability. To make this explicit, we slightly re-state  $\prec$ -stable semantics in the following proposition.

**Proposition 4.** *Let  $D = (\mathcal{L}, \mathcal{R}, \mathcal{A}, \neg, \leq)$  be an  $ABA^+$  framework. A conflict-free set  $E \subseteq \mathcal{A}$  is stable iff for all  $\{b\} \subseteq \mathcal{A}$  that are not normally  $\prec$ -attacked by  $E$ , either  $b \in E$  or  $\{b\}$  is reversely  $\prec$ -attacked by  $E$ .*

In this proposition we have explicitly distinguished between normal and reverse  $\prec$ -attacks (which will also be useful for our encoding later), and explicated that the required conditions only rely on the notion of forward-derivability.

We move on to investigating the complexity of  $ABA^+$  semantics, which are key to approach ASP encodings. Central to understanding the complexity of  $ABA^+$  is understanding the complexity of  $\prec$ -attacks. In  $ABA$ , attacks take a (relatively) simple form: sets of assumptions attack single assumptions in the definition of an  $ABA$ 's attack. In both  $ABA$  and  $ABA^+$  attacks satisfy  $\subseteq$ -monotonicity of the following form: if  $A (\prec)$ attacks  $B$  then  $A' (\prec)$ attacks  $B'$  whenever  $A \subseteq A'$  and  $B \subseteq B'$  (Cyras and Toni 2016b, Lemma 3). That is, in  $ABA$ , if  $A$  attacks  $b$ , then  $A$  attacks any  $B$  with  $b \in B$ . Attacks in  $ABA^+$ , while also  $\subseteq$ -monotone may, in cases, not attack singleton sets of assumptions. Normal  $\prec$ -attacks in an  $ABA^+$  framework are similar to attacks in an  $ABA$ , reverse  $\prec$ -attacks *originate* from singleton sets of assumptions, yet attack a set of assumptions. Put differently, in  $ABA$ , if a set  $B$  is attacked, by  $A$ , then there is at least one singleton set  $\{b\} \subseteq B$  s.t.  $\{b\}$  is attacked by  $A$ . The same does not hold for reverse  $\prec$ -attacks in  $ABA^+$ .

As we show, the difference in attacks between  $ABA$  and  $ABA^+$  is significant from a computational perspective. We classify four types of (counter)  $\prec$ -attacks that are useful for understanding complexity of  $ABA^+$ . For two sets of assumptions,  $A$  and  $B$ , we distinguish whether (i)  $A$  normally  $\prec$ -attacks  $B$ , (ii)  $A$  reversely  $\prec$ -attacks  $B$ , (iii)  $A$  normally  $\prec$ -attacks all subsets  $B' \subseteq B$  that  $\prec$ -attack  $A$ , and (iv)  $A$  reversely  $\prec$ -attacks all subsets  $B' \subseteq B$  that  $\prec$ -attack  $A$ .

**Proposition 5.** *Let  $(\mathcal{L}, \mathcal{R}, \mathcal{A}, \neg, \leq)$  be an  $ABA^+$  framework, and  $A$  and  $B$  two sets of assumptions. One can decide in polynomial time whether set  $A$*

1. normally  $\prec$ -attacks  $B$ ,
2. reversely  $\prec$ -attacks  $B$ , or
3. normally  $\prec$ -attacks all subsets  $B' \subseteq B$  that  $\prec$ -attack  $A$ .

*Proof.* (sketch) For 1., consider each  $b \in B$  separately and compute  $A_b = \{a \in A \mid a \not\prec b\}$ . If  $A_b \vdash_{\mathcal{R}} \bar{b}$  then  $A_b$  normally  $\prec$ -attacks  $\{b\}$ , and by monotonicity  $A$  normally  $\prec$ -attacks  $B$ . For 2., compute  $Th_{\mathcal{R}}(B)$ . For each  $a \in A$ , if  $\bar{a} \in Th_{\mathcal{R}}(B)$ , construct a graph with node set equal to  $Th_{\mathcal{R}}(B)$  and iteratively add edges from  $\bar{a}$  to sentences  $x$  whenever there is a rule with  $\bar{a}$  in the head and  $x$  in the body; continue this process for the body elements  $x$  as rules' heads and their bodies (until a fixed point is reached). There is a tree-derivation  $B' \models_{\mathcal{R}} \bar{a}$  with  $B' \subseteq B$  s.t. there is a  $b \in B'$  with  $b < a$  if such a  $b$  is connected to  $\bar{a}$  in the graph. For 3., compute  $X = \{b \in B \mid A \text{ normally } \prec\text{-attacks } \{b\}\}$ , which can be done in polynomial time according to 1. Next, check whether  $B \setminus X \prec$ -attacks  $A$  (via 1. and 2.). If so, then  $A$  does not counter all  $\prec$ -attacks via normal  $\prec$ -attacks.  $\square$

We emphasize that the second item in the preceding proposition is polynomial time decidable, since one does not need to find subset-minimal  $B' \subseteq B$  that are reversely  $\prec$ -attacked by  $A$ , and that the third item in the preceding proposition is polynomial time decidable, since normal  $\prec$ -attacks target only singleton sets of assumptions. Before delving into attacks of type (iv), from the preceding proposition, we can derive complexity of verifying whether a set of assumptions is  $\prec$ -stable. Note that the property of being conflict-free does not depend on the preference relation (Cyras and Toni 2016b, Theorem 5), and can be checked in polynomial time.

**Theorem 6.** *Verifying whether a set of assumptions is  $\prec$ -stable in an  $ABA^+$  framework is in  $P$ . Checking credulous (skeptical) acceptance of a sentence under  $\prec$ -stable semantics in  $ABA^+$  is NP-complete (coNP-complete).*

This means that  $\prec$ -stable semantics exhibits the same computational complexity as (non-preference-based) stable semantics in  $ABA$ . Complexity does not carry over from  $ABA$  to  $ABA^+$  for the other semantics under consideration. In fact, when considering counterattacks (defense) against potentially non-singleton sets of assumptions, i.e., scenario (iv) from above, it is coNP-hard to decide, as we show next.

**Proposition 7.** *Deciding whether a given set  $A$  of assumptions in an  $ABA^+$  framework reversely counterattacks all assumption sets that  $\prec$ -attack  $A$  is coNP-complete. Hardness holds even when assuming WCP.*

*Proof.* For membership, consider the complementary problem, i.e., given an  $ABA^+$  framework, a set of assumptions  $A$ , check whether there is a set  $B$  of assumptions that  $\prec$ -attacks  $A$  and  $A$  does not reversely  $\prec$ -attack  $B$ . This is in NP, since one can non-deterministically construct  $B$ , check whether  $B \prec$ -attacks  $A$  and whether  $A$  does not  $\prec$ -reversely attack  $B$ , in polynomial time (see Proposition 5).

Let  $\phi = c_1 \wedge \dots \wedge c_m$  be a Boolean formula in conjunctive normal form over vocabulary  $X = \{x_1, \dots, x_n\}$  and clauses  $C = \{c_1, \dots, c_m\}$ . For a clause  $c_j = l_1 \vee \dots \vee l_s$  let  $neg(c_j) = \neg l_1, \dots, \neg l_s$  with  $\neg l_i = x$  if  $l_i = \neg x$  and  $\neg l_i = \neg x$  if  $l_i = x$ . Construct  $ABA^+ F = (\mathcal{L}, \mathcal{R}, \mathcal{A}, \neg, \leq)$  with  $\mathcal{A} = \{a, b\} \cup X \cup \neg X$  for  $\neg X = \{\neg x \mid x \in X\}$  and the following rules.

$$\begin{aligned} d_i &\leftarrow x_i \quad \text{and} \quad d_i \leftarrow \neg x_i \quad \text{for } 1 \leq i \leq n; \\ a^c &\leftarrow d_1, \dots, d_m; \\ b^c &\leftarrow x_i, \neg x_i, a^c \quad \text{for } 1 \leq i \leq n; \text{ and} \\ b^c &\leftarrow neg(c_j), a^c \quad \text{for } 1 \leq j \leq m, \end{aligned}$$

with  $a^c$  and  $b^c$  the contraries of  $a$  and  $b$  respectively (no other contraries are needed). Complete the instance with setting  $b > x_i$  and  $b > \neg x_i$  for  $1 \leq i \leq n$ .

We claim that  $\{a, b\}$  is reversely  $\prec$ -attacking all assumption sets  $X$  that  $\prec$ -attack  $\{a, b\}$  in  $F$  iff  $\phi$  is unsatisfiable. Note that one cannot derive a contrary of any assumption from  $\{a, b\}$ . Thus  $\{a, b\}$  does not normally  $\prec$ -attack any assumption set and no assumption set can reversely  $\prec$ -attack  $\{a, b\}$  (this would require  $\{a, b\}$  to derive a contrary of an assumption). Thus,  $\{a, b\}$  is reversely  $\prec$ -attacking all assumption sets  $X$  that  $\prec$ -attack  $\{a, b\}$  in  $F$  iff  $\{a, b\}$  is  $\prec$ -admissible.

Assume that  $\{a, b\}$  is not  $<$ -admissible. Since  $\{a, b\}$  is conflict-free, there is a  $B \subseteq \mathcal{A}$  s.t.  $B$   $<$ -attacks  $\{a, b\}$  and  $\{a, b\}$  does not  $<$ -attack  $B$ . Thus, if  $B$   $<$ -attacks  $\{a, b\}$ , then  $B$  normally  $<$ -attacks  $\{a, b\}$  and  $B \vdash_{\mathcal{R}} a^c$ , since if  $B$  derives  $b^c$  (either by  $\vdash$  or  $\models$ ), the only other contrary, then  $B$  also derives  $a^c$ . If  $B \vdash_{\mathcal{R}} b^c$ , then  $\{a, b\}$  reversely  $<$ -attacks  $B$  (since  $b$  is preferred to any assumption required to derive either  $a^c$  or  $b^c$ ). By presumption,  $B$  does not derive  $b^c$ . Since  $B$  does derive  $a^c$ ,  $B$  contains exactly one of  $x_i$  or  $\neg x_i$  for each  $1 \leq i \leq n$  (one of each is required to derive  $a^c$ , if both are present  $b^c$  is derived). This defines a truth assignment on  $X$ : true if  $x_i$  is present in  $B$ , false otherwise. Since  $B$  does not derive  $b^c$ , all bodies of rules  $b^c \leftarrow \text{neg}(c_j), a^c$  for  $1 \leq j \leq m$  are not satisfied (at least one element of these bodies is missing/non-derivable from  $B$ ). Thus  $B$  satisfies each clause:  $B$  does not contain all elements from  $\text{neg}(c_j)$  iff  $B$  satisfies at least one literal in clause  $c_j$  iff  $B$  satisfies  $c_j$ . Since this holds for all clauses,  $B$  satisfies  $\phi$ .

For the other direction, assume that  $\phi$  is satisfiable. We show that  $\{a, b\}$  is not admissible. Assume a truth assignment  $\tau$  s.t.  $\tau$  satisfies  $\phi$ . Construct  $B = \{x_i \mid \tau(x_i) = 1\} \cup \{\neg x_i \mid \tau(x_i) = 0\}$ . Since  $\tau$  assigns each variable in  $X$  to either true or false,  $B \vdash_{\mathcal{R}} a^c$  (see above). If  $\tau$  satisfies  $\phi$ , then  $\tau$  satisfies each clause  $c_j$ . Then  $B$  does not contain all sentences of body  $\text{neg}(c_j)$ . Thus,  $B \not\vdash_{\mathcal{R}} b^c$ . This implies that  $\{a, b\}$  is not admissible:  $B$   $<$ -attacks  $\{a, b\}$  (normally) but is not reversely  $<$ -attacked (or  $<$ -attacked at all) by  $\{a, b\}$ .

The proof for coNP-hardness holds also when adding the following rules which enforce that WCP is satisfied by the constructed  $\text{ABA}^+$  instance:  $x_i^c \leftarrow b, \neg x_i$  and  $\neg x_i^c \leftarrow b, x_i$  for each  $1 \leq i \leq n$ , and for each clause  $c_j = l_1 \vee l_2 \vee l_3$  adding  $(l_1^c \leftarrow b, l_2, l_3)$ ,  $(l_2^c \leftarrow b, l_1, l_3)$ , and  $(l_3^c \leftarrow b, l_1, l_2)$ , with these new contraries.  $\square$

The previous proposition suggests that, in order to verify whether  $A$  reversely  $<$ -counterattacks  $<$ -attacks from  $B$ , it is required to check for *each subset*  $B'$  of  $B$  whether  $B'$  is  $<$ -attacking and, if so, whether  $A$   $<$ -attacks  $B'$  (knowledge of  $<$ -attacks on  $B$  or any  $\{b\} \subseteq B$  is not sufficient). In particular, this contrasts complexity of  $<$ -admissibility and  $<$ -stability in  $\text{ABA}^+$ , as we show next formally.

**Theorem 8.** *Verifying whether a set of assumptions is  $<$ -admissible in  $\text{ABA}^+$  is coNP-complete. Hardness holds even when assuming WCP.*

Verification complexity under admissibility is a cornerstone of complexity of argumentative reasoning (also in many other argumentation formalisms) due to many semantics being admissibility based. An algorithm that implements a non-deterministic guess of an  $<$ -admissible assumption set (e.g. to check credulous acceptance) requires a coNP-hard (sub)procedure to verify admissibility. This intuition leads to the next hardness result.

**Theorem 9.** *Checking whether a sentence is credulously accepted w.r.t.  $<$ -admissible semantics in  $\text{ABA}^+$  is  $\Sigma_2^P$ -hard.*

Finally, we establish coNP-hardness for assumption-set verification for  $<$ -complete or  $<$ -grounded in  $\text{ABA}^+$ .

**Theorem 10.** *Verifying whether a set of assumptions is  $<$ -complete or  $<$ -grounded in  $\text{ABA}^+$  is coNP-hard.*

## 4 ASP Encodings for ABA and $\text{ABA}^+$

Complementing our theoretical results, we develop answer set programming (Brewka, Eiter, and Truszczyński 2011) encodings for ABA and  $\text{ABA}^+$ , enabling solving  $\sigma$ -assumption set enumeration and acceptance problems directly using state-of-the-art ASP solvers.

**Answer Set Programming.** An answer set program  $\pi$  consists of rules  $r$  of the form  $h \leftarrow b_1, \dots, b_k, \text{not } b_{k+1}, \dots, \text{not } b_m$ , where  $h$  and each  $b_i$  is an atom. A rule is positive if  $k = m$ , a fact if  $m = 0$ , and a constraint if there is no head  $h$ . An atom  $b_i$  is a predicate  $p(t_1, \dots, t_n)$  with each  $t_j$  either a constant or a variable. An answer set program, a rule, and an atom, respectively, is ground if it is free of variables. For a non-ground program,  $GP$  is the set of rules obtained by applying all possible substitutions from the variables to the set of constants appearing in the program. An interpretation  $I$ , i.e., a subset of all the ground atoms, satisfies a positive rule  $r = h \leftarrow b_1, \dots, b_k$  iff all positive body elements  $b_1, \dots, b_k$  are in  $I$  implies that the head atom is in  $I$ . For a program  $\pi$  consisting only of positive rules, let  $Cl(\pi)$  be the uniquely determined interpretation  $I$  that satisfies all rules in  $\pi$  and no subset of  $I$  satisfies all rules in  $\pi$ . Interpretation  $I$  is an answer set of a ground program  $\pi$  if  $I = Cl(\pi^I)$  where  $\pi^I = \{(h \leftarrow b_1, \dots, b_k) \mid (h \leftarrow b_1, \dots, b_k, \text{not } b_{k+1}, \dots, \text{not } b_m) \in \pi, \{b_{k+1}, \dots, b_m\} \cap I = \emptyset\}\}$  is the reduct; and of a non-ground program  $\pi$  if  $I$  is an answer set of  $GP$  of  $\pi$ .

We make use of specific conditional literals (Gebser et al. 2015) from the extended ASP language (<https://potassco.org/>), namely,  $p(X) : q(X, Y)$  (or  $p(X) : q(X)$ ) only with atoms  $q(X, Y)$  ( $q(X)$ ) given as facts and the variables of atom  $p$  being a subset of the variables of atom  $q$ . Semantically, conditional literals simplify for our purposes to a conjunction  $p(t_1), \dots, p(t_n)$  for all groundings to variable  $X$  for atom  $q(X, Y)$  ( $q(X)$ ). We also use optimization statements from asprin (Brewka et al. 2015). For our purposes, a small subset of features is sufficient: we augment answer set programs with optimization statements that enforce that only optimal answer sets are returned that are  $\subseteq$ -maximal w.r.t. a specified predicate  $p$  of arity one (i.e.,  $I$  is then an optimal answer set if there is no answer set  $J$  such that  $\{p(t) \mid p(t) \in I\} \subset \{p(t) \mid p(t) \in J\}$ ).

**ASP Encodings for ABA.** We represent an ABA framework  $F = (\mathcal{L}, \mathcal{R}, \mathcal{A}, \neg)$  with  $\mathcal{R} = \{r_1, \dots, r_n\}$ , via the ASP facts

$$\begin{aligned} &\{\text{asm}(a). \mid a \in \mathcal{A}\} \cup \{\text{head}(i). \mid r_i \in \mathcal{R}\} \cup \\ &\{\text{body}(i, b). \mid r_i \in \mathcal{R}, b \in \text{body}(r_i)\} \cup \\ &\{\text{contrary}(a, b). \mid b \in \bar{a}, a \in \mathcal{A}\}, \end{aligned}$$

i.e., rules are associated with a unique index, and a predicate **body** contains all body elements.

We develop ASP encodings  $\pi_\sigma$  under a semantics  $\sigma$  s.t.  $A$  is a  $\sigma$ -assumption set iff there is an answer set  $M$  of  $\pi_\sigma$  with  $A = \{a \mid \text{in}(a) \in M\}$ . We begin with an ASP module (subprogram)  $\pi_{\text{common}}$  (see Listing 1) common to several semantics. The first two lines encode a non-deterministic guess of a subset of the given assumptions, with **in** and **out** denoting what is inside and outside the set, resp. The next

Listing 1: Module  $\pi_{common}$ 


---

```

in(X)  $\leftarrow$  asm(X), not out(X).
out(X)  $\leftarrow$  asm(X), not in(X).
supp(X)  $\leftarrow$  asm(X), in(X).
supp(X)  $\leftarrow$  head(R,X), trig_in(R).
trig_in(R)  $\leftarrow$  head(R, _), supp(X) : body(R,X).
 $\leftarrow$  in(X), contrary(X,Y), supp(Y).
defeated(X)  $\leftarrow$  supp(Y), contrary(X,Y).

```

---

three lines encode forward-derivations via the ASP predicate **supp** (recall that in ABA we can focus on forward-derivations only). Formally, for an assumption set  $A$  represented via **in**, if  $A \vdash_{\mathcal{R}} x$ , then **supp**( $x$ ) is included in an answer set. The third line encodes the base case, i.e., derivable assumptions. The fourth line encodes that whenever a rule is “triggered”, i.e., all its body elements are derivable from  $A$  represented via **trig\_in**( $R$ ), then the **head** of that rule shall be derived. The fifth rule encodes triggering of rules, where we make use of the ASP conditional construct. An ABA rule in the framework (checked with usage of **head**) is triggered whenever all its body elements are supported (derivable). Intuitively, the conditional **supp**( $X$ ) : **body**( $R, X$ ) holds if all ASP atoms **supp**( $X$ ) are present for each **body**( $R, X$ ) of the current rule index  $R$ . Analogously, one can view the ASP conditional for  $R = i$  by expanding it to a list **supp**( $x_1$ ), ..., **supp**( $x_n$ ) if  $r_i = h \leftarrow x_1, \dots, x_n$ . The sixth rule ensures conflict-freeness of the guessed assumption set: whenever assumption  $X$  is included, one can derive sentence  $Y$  from the currently guessed assumption set, and  $Y$  is the contrary of  $X$ , we have a conflict, which is to be removed via the constraint. The last rule derives attacked (defeated) assumptions by the guessed assumption set.

With the preceding ASP rules, we encode ABA stable semantics by conjoining  $\pi_{common}$  with a rule that all assumptions not part of the guessed assumption set (i.e., those that are **out**) must be defeated:  $\leftarrow$  **out**( $X$ ), *not* **defeated**( $X$ ).

A conflict-free assumption set  $A$  is admissible iff the set of assumptions  $B$  that are not attacked by  $A$  do not attack  $A$  (Proposition 1). Accordingly, in Listing 2, we check whether a contrary of an in assumption is derivable from undefeated assumptions. For  $\pi_{adm}$  we make use of the same scheme using conditionals as for  $\pi_{common}$ , except referring to different sets of assumptions (the undefeated assumptions). The ASP encoding for admissibility is  $\pi_{common} \cup \pi_{adm}$ .

Complete semantics is encoded by conjoining  $\pi_{common}$ ,  $\pi_{adm}$  and the rule  $\leftarrow$  **out**( $X$ ), *not* **att\_undef**( $X$ ) which

Listing 2: Module  $\pi_{adm}$ 


---

```

deriv_undef(X)  $\leftarrow$  asm(X), not defeated(X).
deriv_undef(X)  $\leftarrow$  head(R,X), trig_undef(R).
trig_undef(R)  $\leftarrow$  head(R, _),
    deriv_undef(X) : body(R,X).
att_undef(X)  $\leftarrow$  contrary(X,Y), deriv_undef(Y).
 $\leftarrow$  in(X), att_undef(X).

```

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Listing 3: Module  $\pi_{grd}$ 


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```

rule(R)  $\leftarrow$  head(R, _).
sentence(S)  $\leftarrow$  head(_, S).
sentence(S)  $\leftarrow$  contrary(_, S), not asm(S).
deriv(X)  $\leftarrow$  asm(X).
deriv(X)  $\leftarrow$  head(R,X), deriv_rule(R).
deriv_rule(R)  $\leftarrow$  head(R, _), deriv(X) : body(R,X).
in(X)  $\leftarrow$  asm(X), out(Y) : contrary(X,Y).
in(R)  $\leftarrow$  rule(R), in(X) : body(R,X).
in(S)  $\leftarrow$  in(R), head(R,S).
out(X)  $\leftarrow$  in(Y), contrary(X,Y).
out(R)  $\leftarrow$  out(X), body(R,X).
out(S)  $\leftarrow$  sentence(S), out(R) : head(R,S).
out(S)  $\leftarrow$  sentence(S), not deriv(S).

```

---

encodes the check for an assumption  $X$  not present in the guessed set of assumptions  $A$  and that is not attacked by the undefeated assumptions, which implies that  $X$  is in fact defended by  $A$ . In case such an  $X$  exists, this ASP constraint ensures that such a guess does not lead to an answer set.

An admissible (complete) assumption set  $A$  is preferred if there is no superset of  $A$  that is also admissible (complete). To compute preferred assumption sets, we make use of asprin (Brewka et al. 2015) and define an optimization statement that enforces that only answer sets are returned that are subset-maximal w.r.t. **in** (mirroring subset maximality). The system asprin supports such an optimization out of the box.

Listing 3 gives an ASP encoding of grounded ABA semantics. We directly encode the iterative defense of assumptions, starting from the empty set. The first three rules derive all rules and sentences present in the ABA framework. The next three ASP rules encode via predicate **deriv** derivable sentences (in principle from the whole set of assumptions). In short, different to the other semantics, the remaining rules partition assumptions, rules, and sentences into three parts that are iteratively adapted: the set in, the set out, and elements that are neither. Interestingly, this encoding is within a tractable ASP fragment: the unique answer set of the corresponding ground program is computable in polynomial time, since default negation *not* in the encoding is stratifiable. Hence polynomial-time computability of the grounded assumption set (Corollary 2) is preserved under this encoding.

**ASP Encoding for ABA<sup>+</sup> Stable Semantics.** A conflict-free assumption set  $A$  is  $\leftarrow$ -*stb* iff each assumption  $b \in A$  that is not  $\leftarrow$ -normally attacked by  $A$  is either in  $A$  or reversely  $\leftarrow$ -attacked by  $A$  (Prop. 4). By Lemma 3, one can check if a set of assumptions is  $\leftarrow$ -*stb* via only using forward-derivability. Thus, we can implement  $\leftarrow$ -*stb* semantics via forward-derivability (as for ABA above): perform an ASP guess of a set, check conflict-freeness via the corresponding rules in  $\pi_{common}$ , compute each  $\{b\}$  normally  $\leftarrow$ -attacked (see also proof of Prop. 5), and from the remaining assumptions  $\{c\}$  not normally  $\leftarrow$ -attacked whether they are reversely  $\leftarrow$ -attacked. Since the encoding is more involved, it is detailed in the supplement. The encoding is independent of whether the given framework satisfies WCP or not.

## 5 Experiments

We present empirical results comparing the performance of the state-of-the-art ASP solver Clingo on our ASP encodings to currently available systems for ABA and ABA<sup>+</sup>. For ABA, abagraph implements the so-called dispute derivation approach (Craven and Toni 2016) using Prolog, while aba2af translates the ABA to abstract argumentation frameworks and uses AF-level ASP encodings to solve the ABA reasoning problem (Lehtonen, Wallner, and Järvisalo 2017). For ABA<sup>+</sup>, ABAPlus (Bao, Cyras, and Toni 2017) translates to the AF-level and employs the Aspartix ASP encodings (Egly, Gaggl, and Woltran 2010) to perform ABA<sup>+</sup> reasoning. We note that abagraph only supports the admissible and grounded semantics, while aba2af supports admissible, stable and preferred. We used Clingo v5.2.2 (Gebser et al. 2016) as the ASP solver, and SICStus Prolog v4.4.1 for abagraph. The experiments were run on 2.83-GHz Intel Xeon E5440 quad-core machines with 32-GB RAM under Linux using a 600-second timeout limit per instance.

We used the ABA frameworks (which contain up to 90 sentences) and queries used by Craven and Toni (2016) and Lehtonen, Wallner, and Järvisalo (2017) in experiments on abagraph and aba2af (<http://robertcraven.org/proarg/experiments.html>), and followed the setup of (Craven and Toni 2016; Lehtonen, Wallner, and Järvisalo 2017) when applicable: the enumeration of all solutions w.r.t. a query sentence for ABA *adm*, and skeptical acceptance of a query for ABA *stb*. Within the capabilities of the systems under comparison, we consider credulous acceptance for ABA *grd*, and enumeration of all solutions (no query) for ABA *prf* and ABA<sup>+</sup> *<-stb*. Following (Lehtonen, Wallner, and Järvisalo 2017), for ABA *adm* we filtered out trivial instances. For ABA<sup>+</sup>, the ABAPlus algorithm requires WCP (recall Def. 5), and enforces WCP if not satisfied by changing the input framework, which can be time-consuming. Hence for a fair comparison on ABA<sup>+</sup>, we generated smaller instances following (Craven and Toni 2016) over 10, 14, 18, 22, 26, 30 sentences with 10 frameworks per number of sentences and two preference relations per framework, and used the frameworks as modified by ABAPlus as input to both ABAPlus and our approach. We generated pref-

Table 1: Runtime comparison. Mean (**mean**), median (**med.**) and cumulative running times (**cum.**) over solved instances, **#to** is the number of timeouts. Number of instances: 1466 (*adm*), 6709 (*stb*, *grd*), 680 (*prf*), 120 (ABA<sup>+</sup> *<-stb*).

Problem	Approach	Running times (s)			
		#to	mean	med.	cum.
ABA <i>adm</i> , enum. w/query	ASP	0	0.020	0.008	29
	abagraph	394	18.500	1.175	19832
	aba2af	402	15.357	1.390	16341
ABA <i>stb</i> , skept. accep.	ASP	0	0.009	0.008	59
	aba2af	648	7.246	0.900	43918
ABA <i>grd</i> cred. accep.	ASP	0	0.020	0.012	29
	abagraph	202	10.254	0.972	12961
ABA <i>prf</i> enum. wo/query	ASP	0	0.333	0.328	226
	aba2af	255	6.082	0.464	2585
ABA <sup>+</sup> <i>&lt;-stb</i> enum. wo/query	ASP	0	0.018	0.008	2
	ABAPlus	9	15.583	0.268	1729

Table 2: Scalability of ASP on larger frameworks.

$\mathcal{L}$	#timeouts (mean running time over solved (s))				
	ABA <i>adm</i>	ABA <i>com</i>	ABA <i>stb</i>	ABA <i>prf</i>	ABA <sup>+</sup> <i>&lt;-stb</i>
50	0 (0.02)	0 (0.01)	0 (0.01)	0 (0.3)	0 (0.1)
250	0 (0.4)	0 (0.4)	0 (0.3)	0 (1.5)	0 (12.6)
500	0 (0.9)	0 (0.9)	0 (0.6)	0 (2.7)	0 (53.1)
1000	0 (4.4)	0 (3.7)	0 (1.7)	0 (13.1)	0 (241.0)
1500	0 (28.1)	0 (20.2)	0 (5.5)	0 (107.9)	60 (0.0)
2000	0 (38.5)	0 (30.7)	0 (7.1)	0 (125.0)	60 (0.0)
2500	0 (165.4)	0 (124.3)	0 (30.4)	2 (141.9)	60 (0.0)
3000	24 (331.3)	23 (283.5)	4 (268.4)	3 (0.0)	60 (0.0)
3500	28 (225.7)	27 (262.1)	19 (182.8)	3 (0.0)	60 (0.0)
4000	28 (44.6)	28 (35.2)	28 (14.2)	3 (0.0)	60 (0.0)

erences by choosing a random permutation  $(a_i)_{0 \leq i \leq n}$  of the assumptions, and for each  $j < i$ , set  $a_i$  to be preferred to  $a_j$  with two fixed probabilities, 15% and 40%.

Table 1 overviews the results. ASP, without any timeouts and very small cumulative runtimes, clearly outperforms the other systems on each problem (and supports more problem types than the competing ABA systems). In contrast, the other systems exhibit high numbers of timeouts, especially on the ABA problems. Due to the very good empirical performance of our approach, we studied the scalability of the approach further by generating in the same style as (Craven and Toni 2016) larger benchmarks, three frameworks for each number of sentences, with up to 4000 sentences and rule heads, 37% assumptions, and rules per head and body lengths, resp., randomly chosen within  $[1, \min(n_s/7, 20)]$  and  $[1, \min(n_s/8, 20)]$  with number of sentences  $n_s$ . The results are shown in Table 2 for credulous reasoning on 10 arbitrary queries per ABA framework under *adm*, *com*, and *stb*; for assumption set enumeration under *prf* (as asprin does not directly support queries); and for ABA<sup>+</sup> credulous reasoning under *<-stb* without enforcing WCP. Here we can routinely solve instances with up to 3000 sentences for ABA and up to 1000 for ABA<sup>+</sup>. Within ABA, for *prf* the limit is somewhat lower due to both the complexity of the semantics and the task, but nevertheless significantly higher than for the other systems; for example, even under *adm* abagraph could only solve the 50-sentence instances and none of the larger ones.

## 6 Conclusions

We proposed a new approach to reasoning in assumption-based argumentation with and without preferences based on nontrivial answer set programming encodings of ABA reasoning tasks under several central argumentation semantics. Our approach extends and significantly improves on the empirical performance of the current state-of-the-art approaches to ABA reasoning. Towards bridging the gap between the current knowledge on complexity of reasoning in ABA and ABA<sup>+</sup>, we provided complexity lower bounds for ABA<sup>+</sup> reasoning under several semantics. While credulous acceptance in ABA and ABA<sup>+</sup> has the same complexity under the stable semantics, our results on the complexity of the verification task for ABA<sup>+</sup> strongly suggests that the integration of preferential information into ABA may increase the computational complexity of acceptance problems.

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